

# **VERIFYING NUTRIENTS AS A STRESSOR AND REVISING PHOSPHORUS ENDPOINTS FOR WISSAHICKON CREEK, PA**

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# TWO PART TALK

- **Part 1 – Verifying phosphorus as a cause of stress to aquatic life in the Wissahickon Creek, PA**
- **Part 2 – Revision of the TP endpoint for the PA Piedmont ecoregion**

# **PART 1:**

# **STRESSOR VERIFICATION**

# GOAL

- Verify nutrients as a contributing cause of aquatic life use (ALU) impairment in the Wissahickon
  - Nutrients listed as cause of impairment in 1996 and relisted in subsequent IR cycles
  - Some have argued that nutrients not “the” cause of ALU impairment
  - EPA would like to verify that nutrients are, indeed, a cause of ALU impairment in this stream.

# IDENTIFICATION VS. VERIFICATION

- **Stressor Identification (SI)** is a standardized method of evaluating candidate causes of ALU impairment and identifying those that are likely (EPA CADDIS)
  - Long process, comprehensive.
  - [http://www.epa.gov/caddis/si\\_home.html](http://www.epa.gov/caddis/si_home.html)
- “**Stressor verification**” – alternative; using the framework of the SI process to “verify” that nutrients are defensible cause of stress based on existing evidence
- **Hypothesis driven:** if nutrients are a cause, we expect to see the following...and then test these hypotheses.

**Detect or Suspect Biological Impairment**

**Stressor Identification**

**Define the Case**



**List Candidate Causes**



**Evaluate Data from the Case**



**Evaluate Data from Elsewhere**



**Identify Probable Cause**

**Decision-maker  
and  
Stakeholder  
Involvement**

**As Necessary:  
Acquire Data,  
and  
Iterate Process**

**Identify and Apportion Sources**

**Management Action:  
Eliminate or Control Sources, Monitor Results**

**Biological Condition Restored or Protected**

# STRESSOR IDENTIFICATION

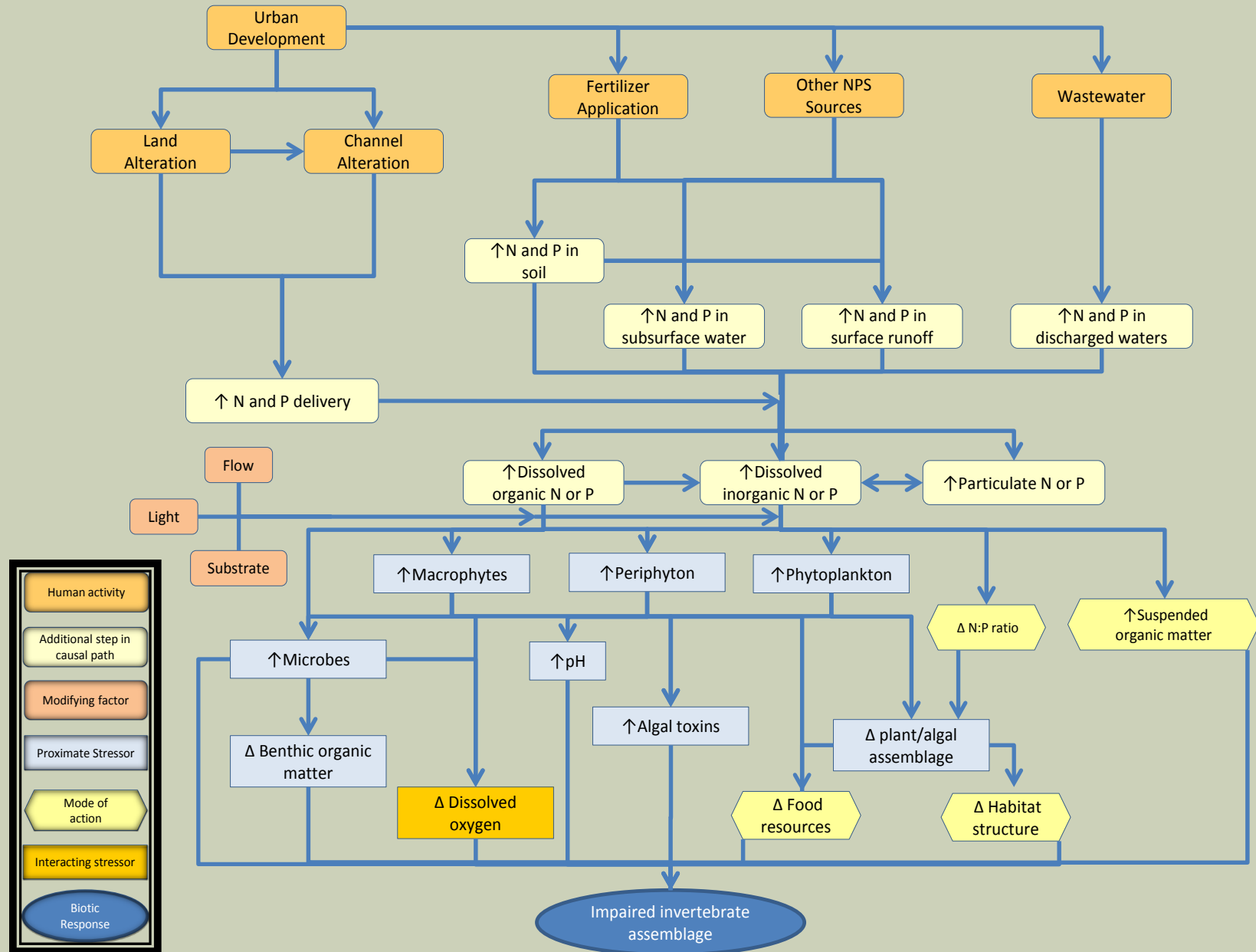
## SI Process

- Conceptual Model
- List Candidate Causes
- Data Synthesis
- Consider Evidence from the Case
- Consider Evidence from outside the Case
- Identify likely causes

## Us

- Conceptual Model
- Nutrient Cause
- Data Synthesis
- Consider Evidence from the Case
- Consider Evidence from outside the Case
- Verify Nutrients

# Wissahickon Conceptual Model



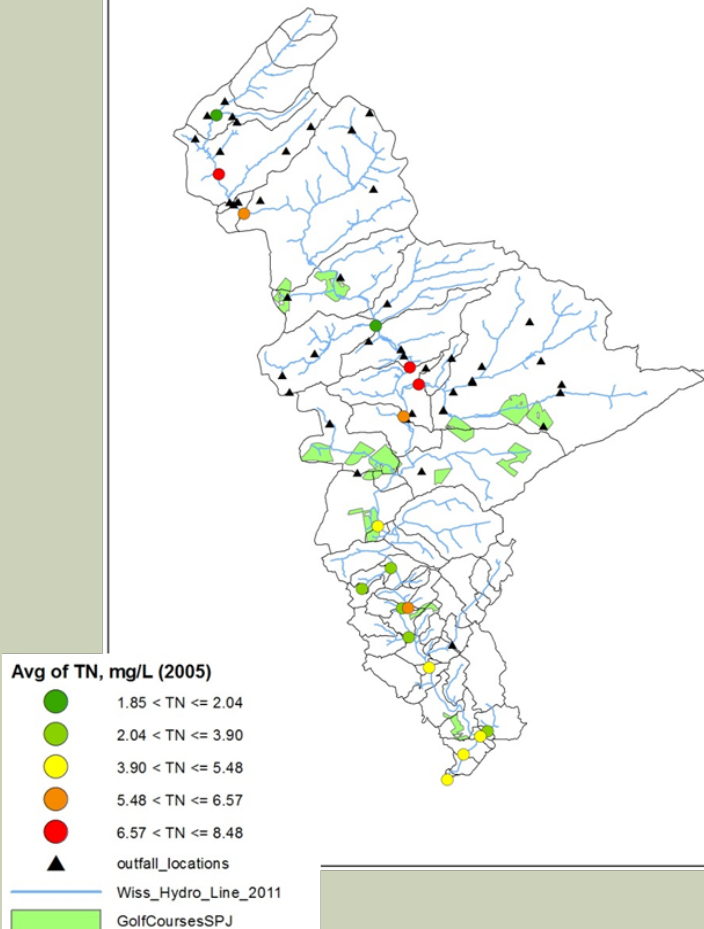


# MODEL “HYPOTHESIS” LEADS TO FOLLOWING PREDICTIONS

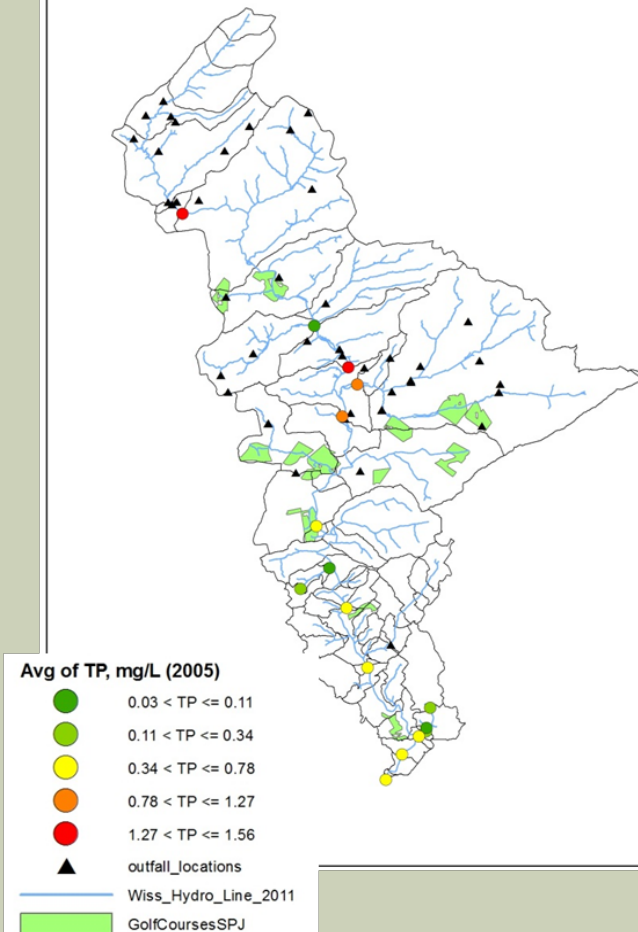
1. Evidence of increased nutrient concentrations in the stream associated with runoff and discharges, as well as baseflow;
2. Evidence of altered N:P ratio associated with elevated nutrient loads;
3. Evidence of increased algal/plant biomass at locations pursuant or coincident with elevated nutrients;
4. Evidence of altered plant/algal assemblage structure pursuant or coincident with elevated nutrients;
5. Evidence of altered suspended organic matter composition pursuant or coincident with elevated nutrients;
6. Evidence of altered dissolved oxygen dynamics (greater diel flux, lower minima, and higher maxima) pursuant or coincident with elevated alga/plant biomass;
7. Evidence of altered pH pursuant or coincident with elevated alga/plant biomass;
8. Evidence of altered invertebrate assemblage composition pursuant or coincident with elevated alga/plant biomass, altered dissolved oxygen, altered pH, altered assemblage composition.

# PREDICTION 1 – INCREASED CONCENTRATIONS

Annual Averages



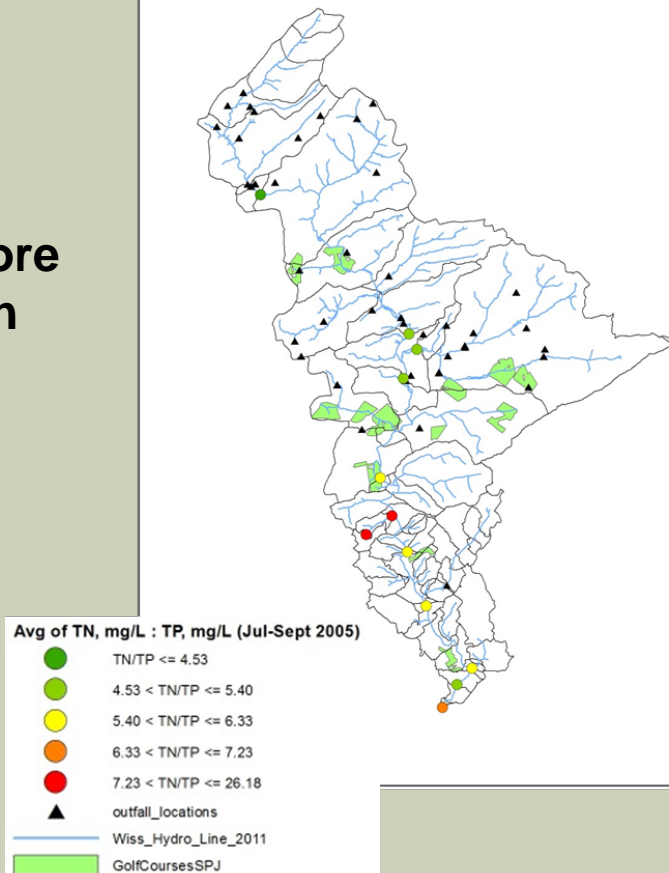
2005 Data



# PREDICTION 2 – ALTERED RATIOS

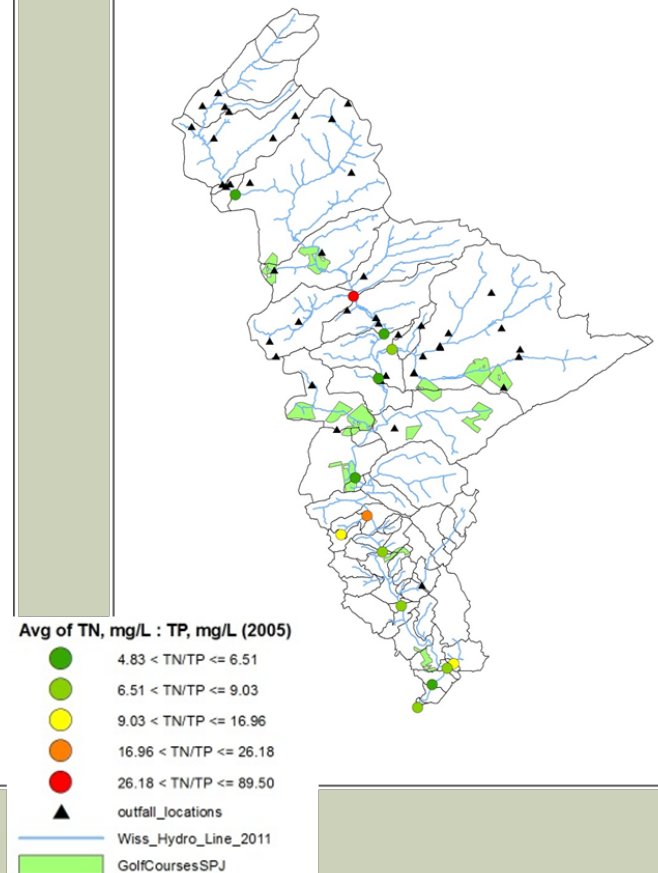
**N:P > 7  
suggests more  
P limitation**

Seasonal Averages



Annual Averages

2005 Data

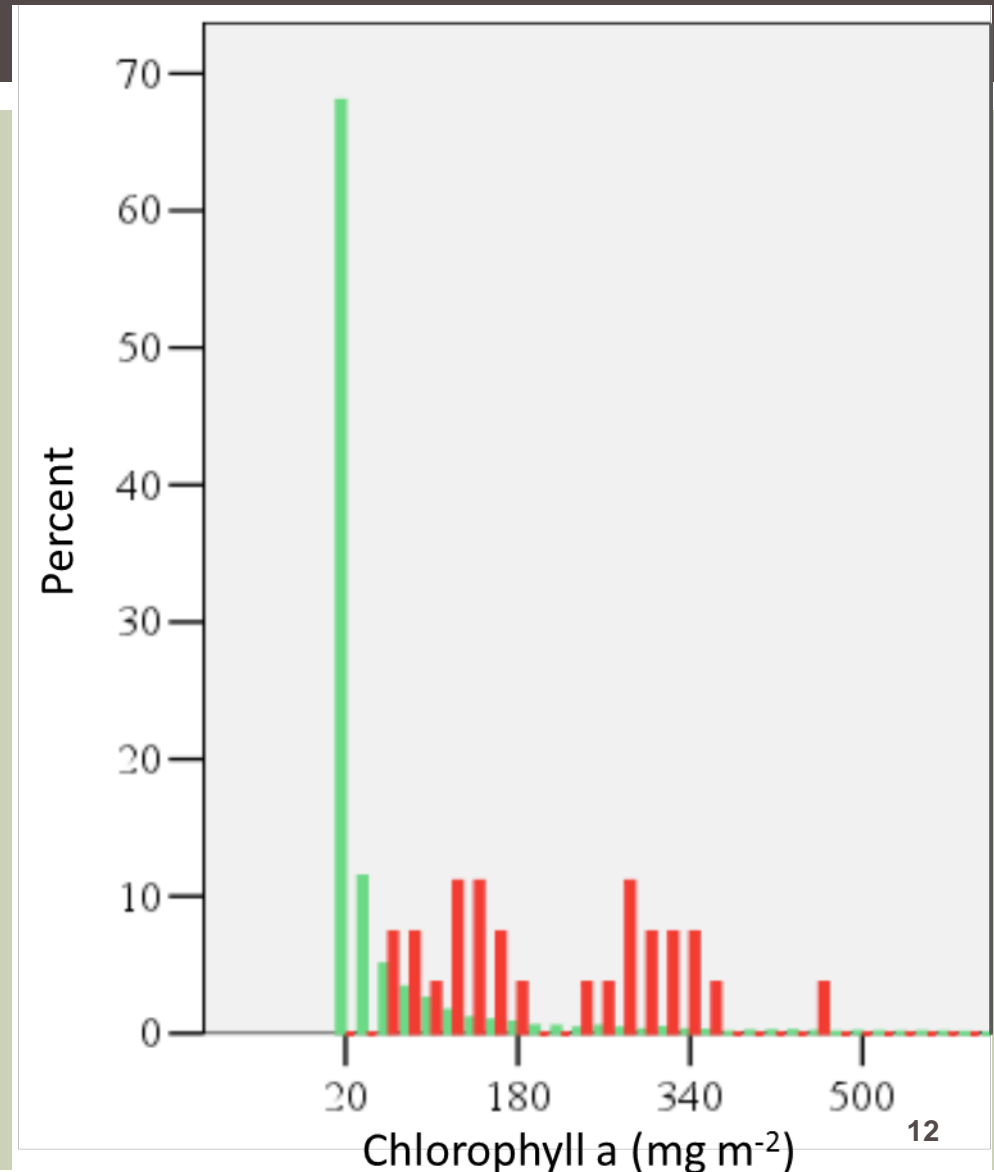


**Stronger N in growing season – P enrichment relative to region (83:1)**

# PREDICTION 3 – INCREASED CHL A

- Clear evidence that chl a reaches instantaneous values considered well above nuisance levels, or levels consistent with harm to aquatic life.
- Chl a vs. nutrient relationships vary in space and time due to factors such as shade, substrate, and scour.

Stressor Verification



# PREDICTION 4 – ALTERED ALGAL ASSEMBLAGE

Dr. Lei Zheng reviewed taxa lists and diatom reports, confirms conclusions that taxa are all diagnostic of high nutrient concentrations.

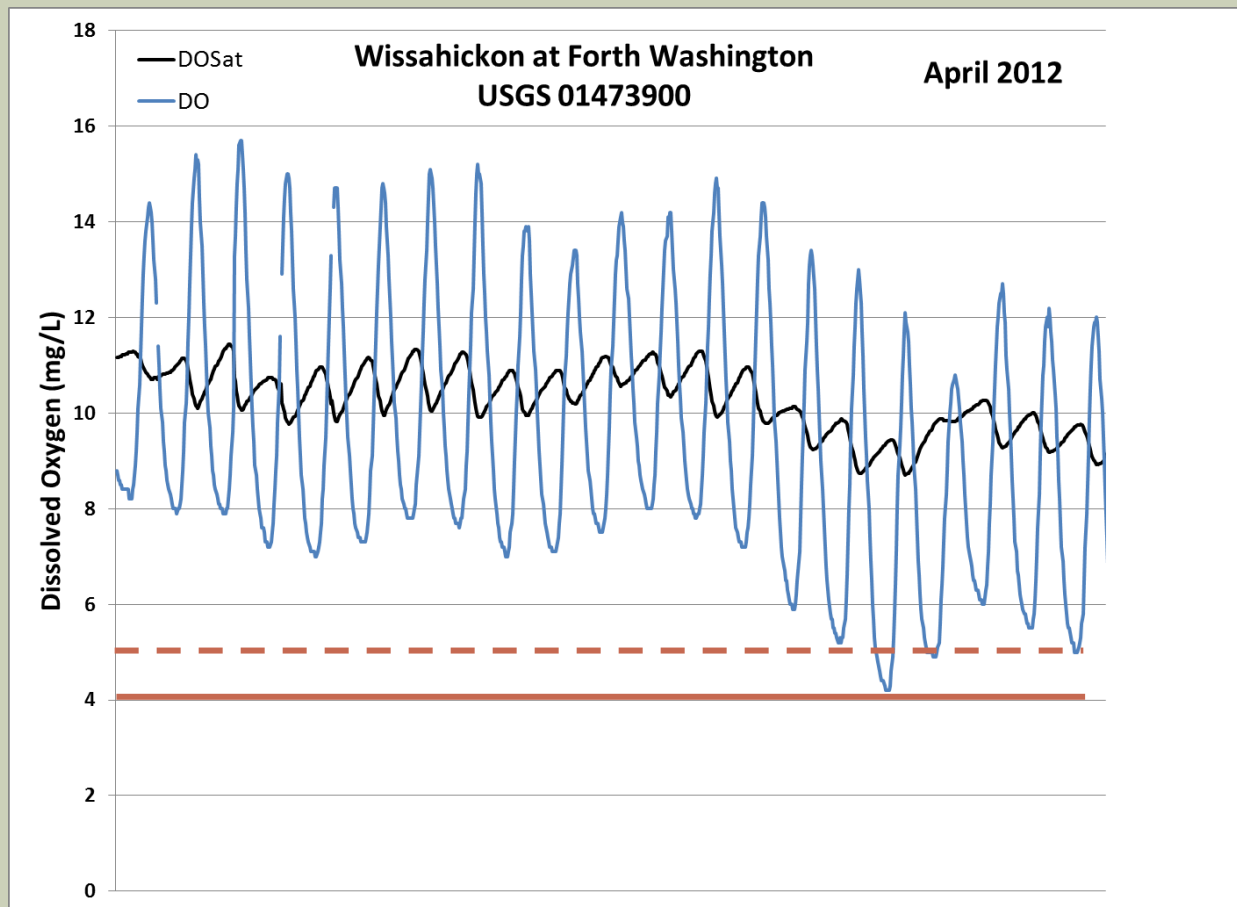
*“Nitzschia inconspicua, Nitzschia amphibian, Navicula minima, Rhoicosphenia curvata, Melosira varians, Amphora pediculus, Synedra fascicualuata, Navicula gregaria, Navicula viriduna var. rostellata, Gomphonema parvulum, Cocconeis placentuala are all strong nutrient indicators.”*

# PREDICTION 5 – ALTERED SUSPENDED ORGANIC MATTER COMPOSITION

- Diatom nutrient content data (Carrick and Godwin 2006) indicate that cells are enriched with N and P relative to “balanced growth” needs.
  - Average C:N:P ratio in Wissahickon = 8:1:1 (based on average concentrations)
  - Much lower than the Redfield ratio (106:16:1) that reflects balanced growth for algae
- Algae are high nutrient taxa and storing excess nutrients- both indicate enrichment.

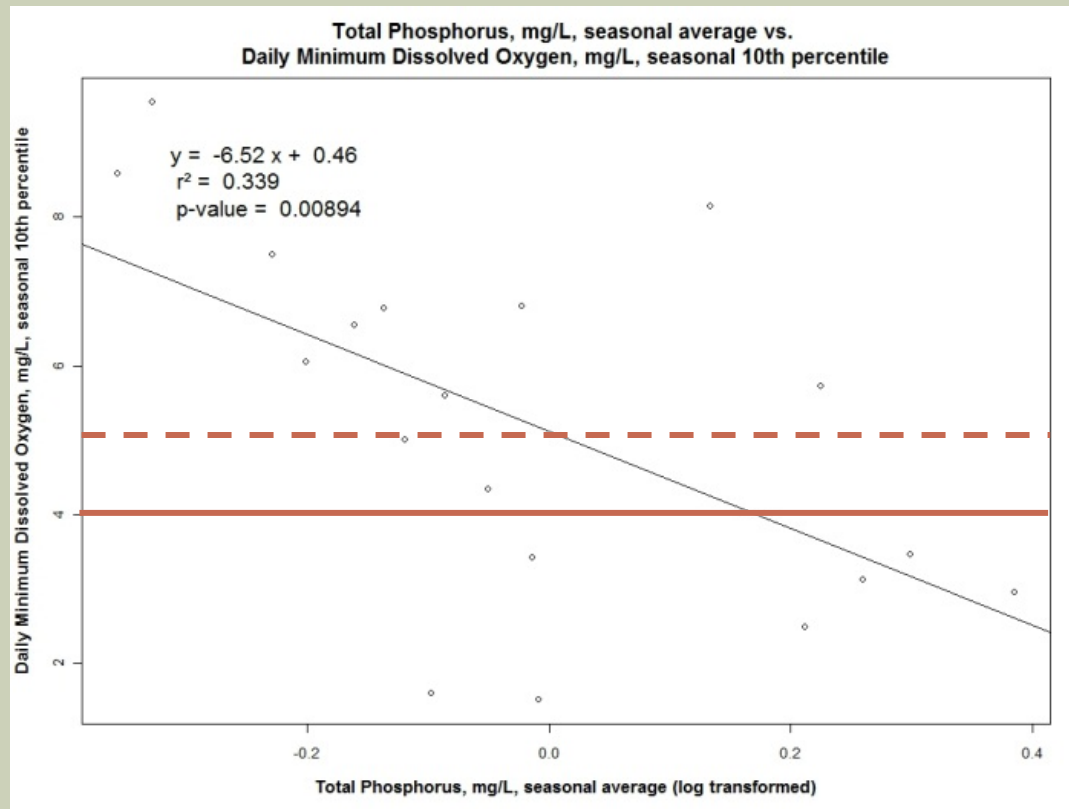
# PREDICTION 6 – ALTERED OXYGEN DYNAMICS

- Large DO swings are typical in the Wissahickon



# PREDICTION 6 – ALTERED OXYGEN DYNAMICS

## ■ Violations of DO standards



- PADEP (2002) study found the same thing – reduced minima and increased diel flux



# PREDICTION 7 – ALTERED PH

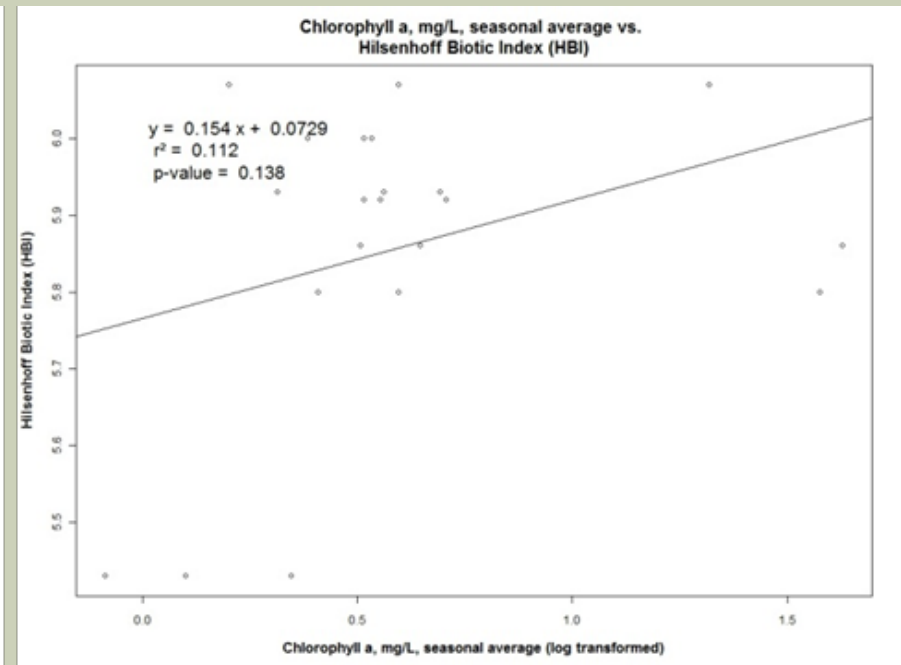
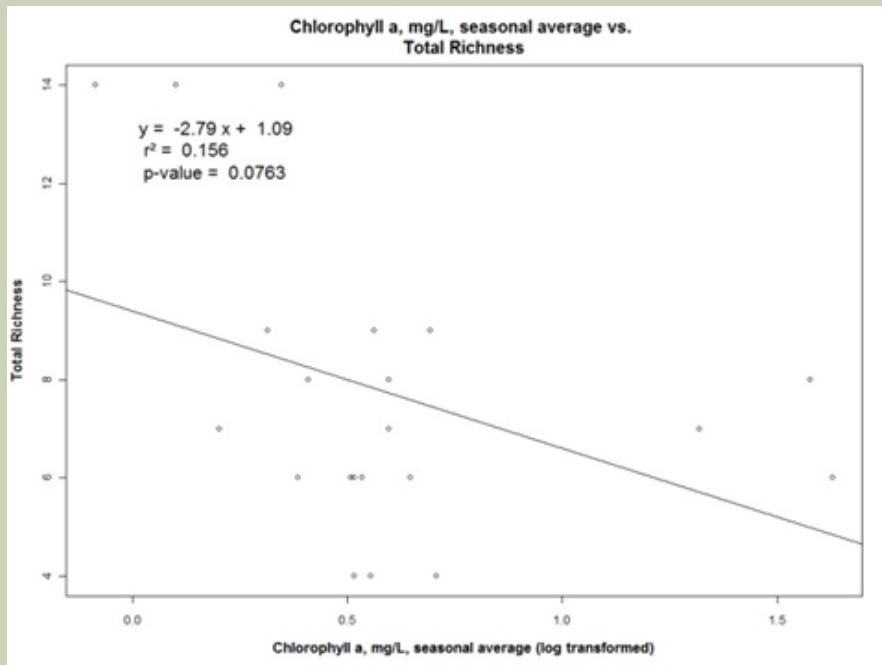
- Supports brown pathway effects – increased respiration fueled by nutrients
- Increased CO<sub>2</sub> – makes carbonic acid (H<sub>2</sub>CO<sub>3</sub>) – lowers pH

Annual Averages	Daily Avg pH	Daily Max pH	Daily Min pH	Daily pH Range
↑TP	↓	↓	↓	NS
Seasonal Averages				
↑TKN	↓	↓	NS	↓
↑TP	↓	↓	↓	NS

2005 Data

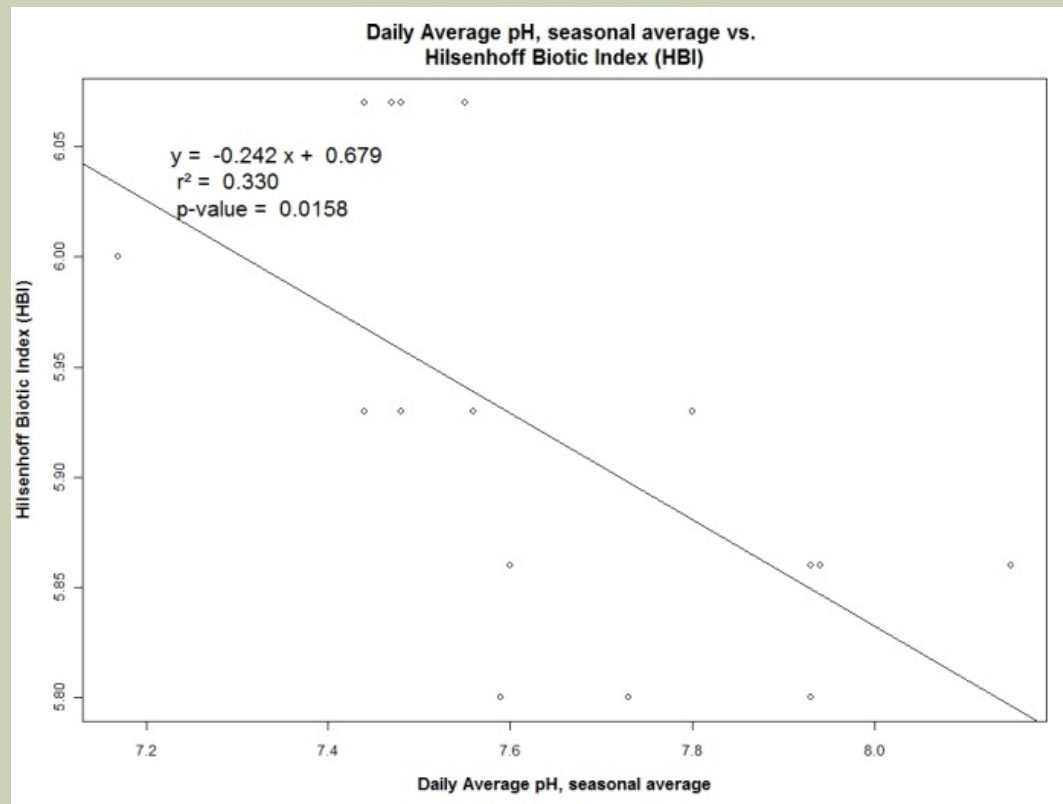
# PREDICTION 8 – ALTERED INVERTEBRATES

- Richness declines and tolerance increases with chlorophyll
- P values above 0.05, but below 0.15
- Responses are non-linear



# PREDICTION 8 – ALTERED INVERTEBRATES

- Tolerance increases with lower pH too.



2005 Data

# SUMMARY

	Prediction	Evidence Supporting
1	Increased nutrient concentrations in the stream associated with runoff and discharges, as well as baseflow	Yes
2	Evidence of altered N:P ratio associated with elevated nutrient loads	Yes
3	Evidence of increased algal/plant biomass at locations pursuant or coincident with elevated nutrients	Yes
4	Evidence of altered plant/algal assemblage structure pursuant or coincident with elevated nutrients	Yes
5	Evidence of altered suspended organic matter composition pursuant or coincident with elevated nutrients	Limited
6	Evidence of altered dissolved oxygen dynamics (greater diel flux, lower minima, and higher maxima) pursuant or coincident with elevated alga/plant biomass	Yes
7	Evidence of altered pH pursuant or coincident with elevated alga/plant biomass	Yes
8	Evidence of altered invertebrate assemblage composition pursuant or coincident with elevated alga/plant biomass, altered dissolved oxygen, altered pH, altered assemblage composition	Limited

# SUMMARY – MULTIPLE LINES

Type of Evidence	Description	Wissahickon
Consistency of Evidence	Confidence in the argument for or against a candidate cause is increased when many types of evidence consistently support or weaken it.	+++ (All evidentiary lines convincingly support the case for the cause)
Explanation of Evidence	Confidence in the argument for a candidate cause is increased when a post hoc mechanistic, conceptual, or mathematical model reasonably explains any inconsistent evidence.	++ (The only inconsistent evidence is from invertebrate response which can be defensibly explained based on the uniformity of impact and the confounding effect of co-occurring stressors with nutrients)

# **PART 2: REVISING THE PIEDMONT TP ENDPOINTS**

**Stressor-  
Response  
Guidance  
and  
SAB Review**

# APPROACHES FOR DEVELOPING NUTRIENT TARGETS

- Population derived approaches\*
- Modeled reference expectation\*
- Nutrient-response based approaches\*
- Mechanistic Models
- Other Studies\*
- Weight-of-evidence
  - Consider all of the above
  - Weight evidence

\*Used in First Endpoints Derivation Effort

# SUMMARY OF FIRST ENDPOINTS ANALYSIS (TOTAL PHOSPHORUS)

Approach		TP Endpoint (µg/L)
<b>Reference Approach</b>	Reference Site 75 <sup>th</sup> Percentile	<b>2-37</b> 16-17
	All Sites 25 <sup>th</sup> Percentile	17
	Modeled Reference Expectation	2-37
<b>Stressor-Response</b>		<b>36-64</b>
	Conditional Probability – EPT taxa	38
	Conditional Probability - % Clingers	39
	Conditional Probability - % Urban Intolerant	64
	Conditional Probability - Diatoms TSI	36
<b>Other Literature</b>		<b>13-100</b>
	USEPA Recommended Regional Criteria	37
	USEPA Regional Criteria Approach – Local Data	40-51
	Algal Growth Saturation	25-50
	Nationwide Meta-Study TP-Chlorophyll	21-60
	USGS Regional Reference Study	20
	USGS National Nutrient Criteria Study	13-20
	New England Nutrient Criteria Study	40
	Virginia Nutrient Criteria Study	50
	New Jersey TDI	25-50
	Delaware Criteria	50-100



# EMPIRICAL APPROACHES FOR NUTRIENT CRITERIA DERIVATION

- EPA provides additional guidance on using stressor-response relationships to derive numeric nutrient criteria
- Particular focus on stressor-response analysis and recommendation for nutrient criteria development
- Draft: 2009
- SAB Review: 2009/2010
- Final: 2010



United States  
Environmental Protection  
Agency

Office of Water  
Mail code 4304T

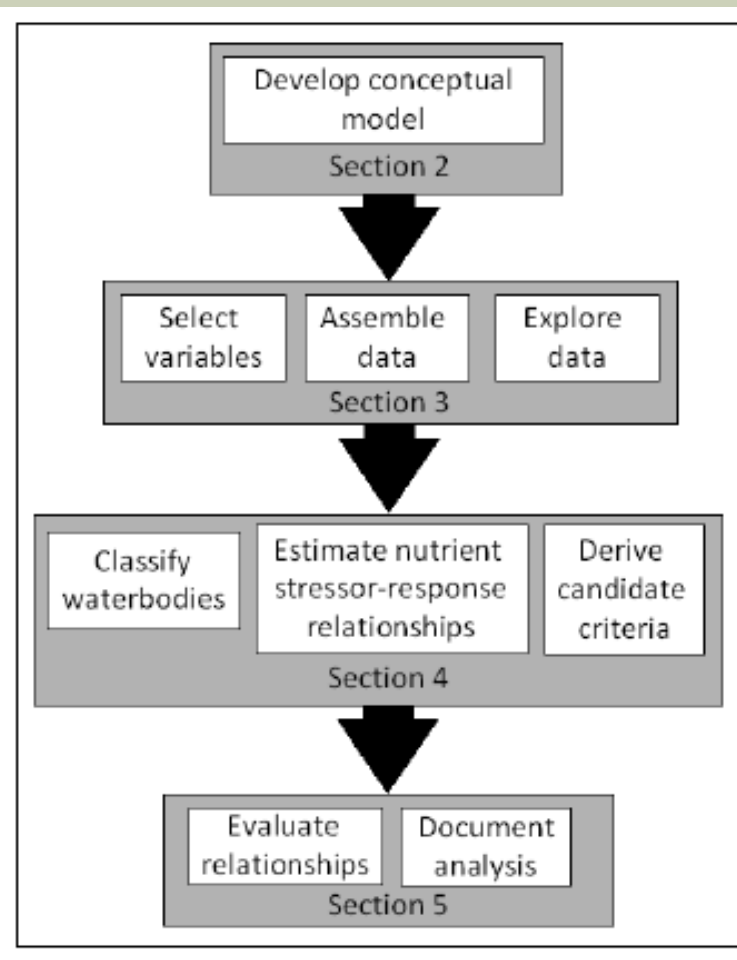
EPA-820-S-10-001  
November 2010

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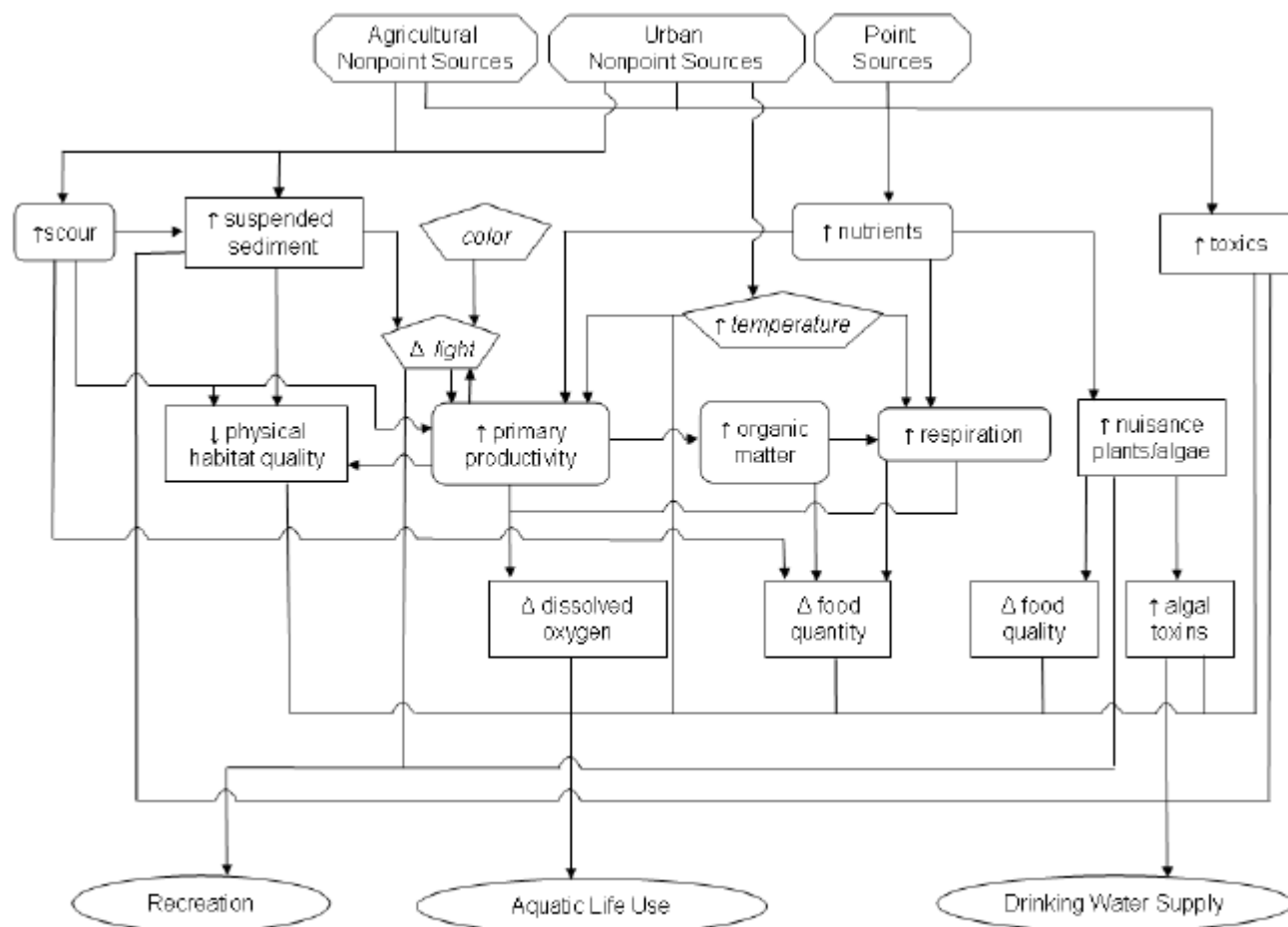
## Using Stressor-response Relationships to Derive Numeric Nutrient Criteria

# WHAT DOES NEW GUIDANCE RECOMMEND?

- Lays out 4 step process:
  - Conceptual Model
  - Data Assembly and Exploration
  - Estimate stressor-response relationship
  - Model review and evaluation



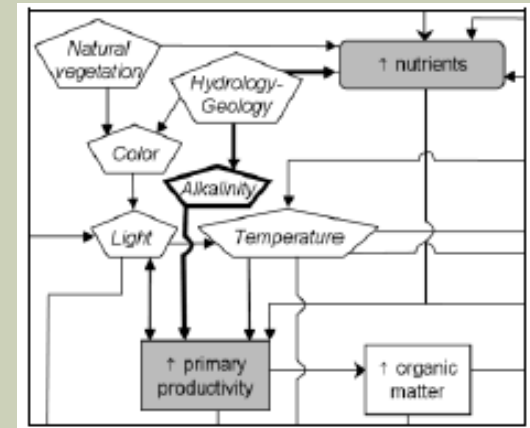
# CONCEPTUAL MODELS



- Scientific basis for stressor-response model

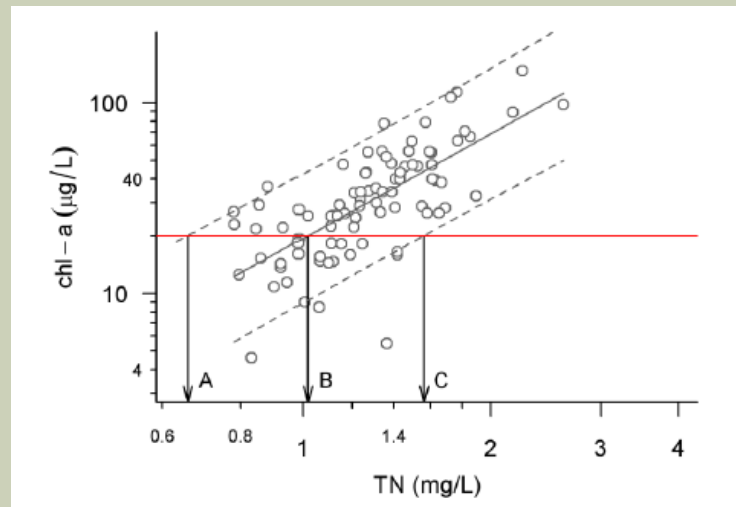
# ASSEMBLE AND EXPLORE DATA

- Identifying co-variates/blocked pathways for consideration in modeling
- Conditional probability presented as an exploratory approach, rather than a criteria derivation approach – upper bounds and exploration of ranges



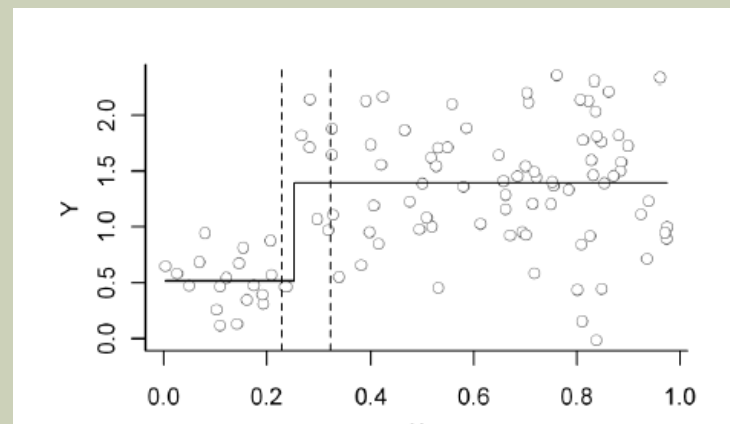
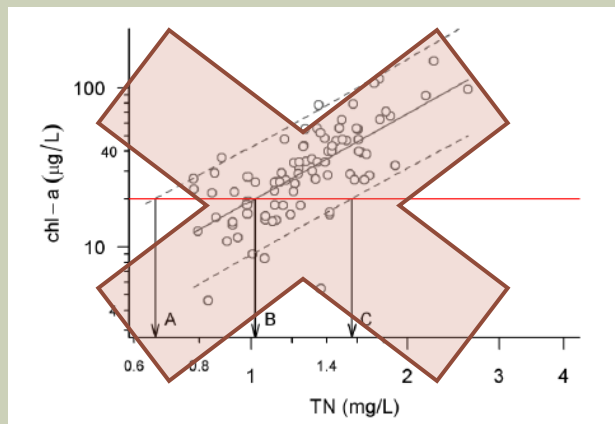
# ANALYZE DATA

- Classify, stressor-response estimation, and criteria derivation
- Classification reduces variation from confounding variables (e.g. ecoregion, land cover, stream size)
- Focus on simple linear regression models with interpolation



# ANALYZE DATA

- Extensions to multiple linear regression
  - Explore other factors/confounding variables and resulting relationship
- Quantile regression
- Changepoint Analysis
  - Underwent some criticism, so recommended only when ecologically and statistically relevant



# EVALUATE AND DOCUMENT

- **Model accuracy**
  - How well does model account for confounding effects?
  - How accurate does it depict the unique nutrient effect?
  - How does it compare to other independent estimates?
- **Model precision**
- **Report model statistics (e.g., prediction and confidence intervals, residual analysis, etc.)**
- **Communicate classification and evaluate effects**
- **Document**

# SAB REVIEW

- EPA Science Advisory Board reviewed draft 2009 document and comments incorporated into final 2010 document
- Major issues:
  - Using empirical stressor-response models was NOT a concern  
“The stressor-response approach is a legitimate, scientifically based method for developing numeric nutrient criteria if the approach is appropriately applied (i.e., not used in isolation but as part of a weight-of-evidence approach). We encourage the Agency to continue this important work.”
  - Clarify scope, intended use and context within other guidance
  - Does not prove cause-effect, therefore use as weight of evidence with other approaches
  - Communicate uncertainty
  - Does not address downstream impacts



# SAB REVIEW

## ■ Recommendations:

- Discuss cause and effect more
- Utility/limitations of statistical methods
- Analysis and data needed to correctly identify predictive relationships
- More guidance on when and how to use various methods/approaches
- How to link designated uses and stressors
- More specific and descriptive framework of steps in process
- Train users

# EPA RESPONSE

## ■ Draft to Final

- More on cause and effect in introduction
- Causal model section added
- Methods greatly reorganized and simplified, limitations discussed,
- Expanded sections on data exploration/needs and analysis options
- Expanded causal model section discusses linkages to designated uses
- Refined framework

## ■ EPA published response to comments

# CONSEQUENCE

**New Stressor-Response Guidance  
+ Stressor-Response in Original Analysis**

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**Desire to revise stressor-response line of  
evidence per new guidance**

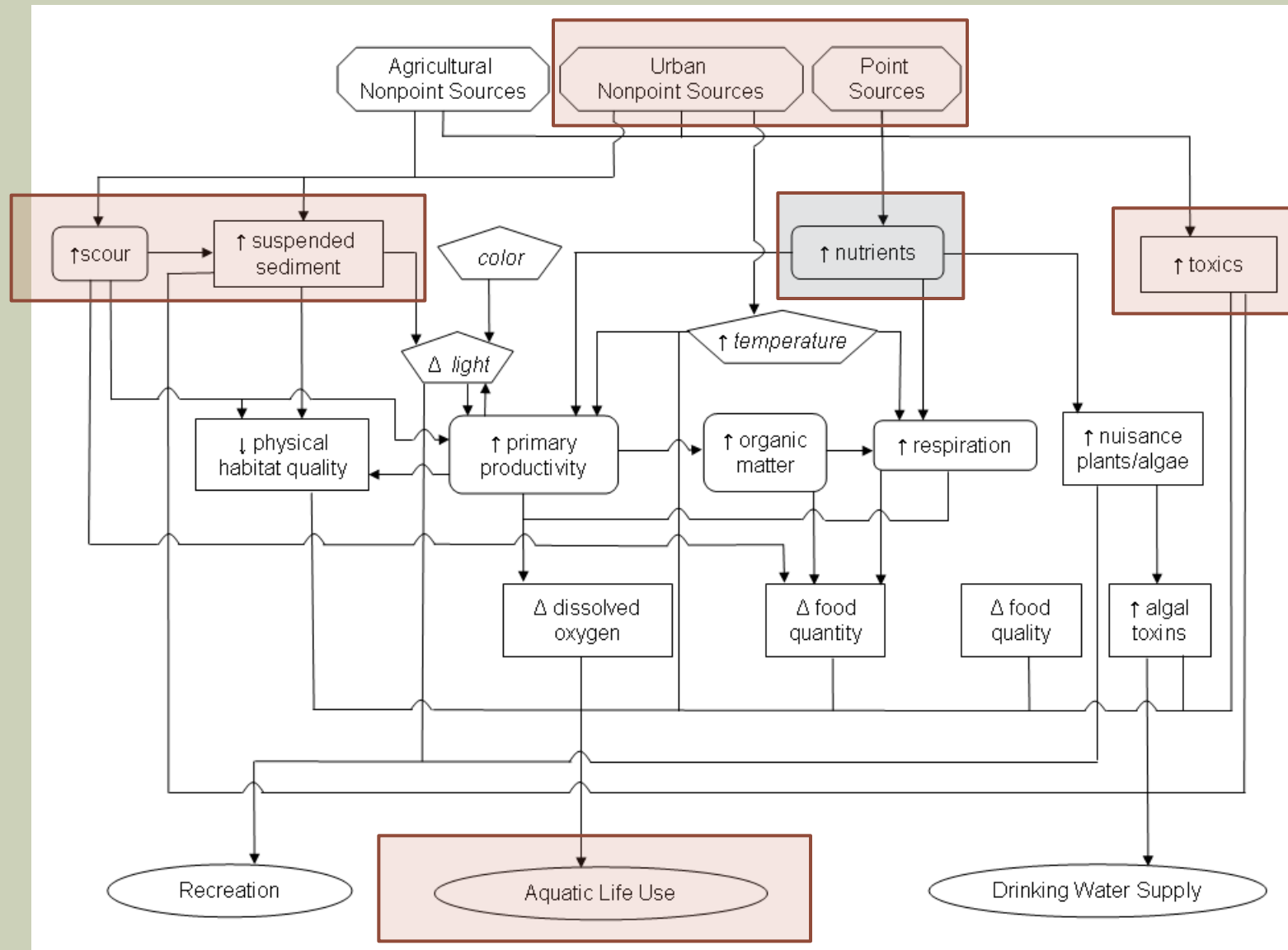
# REVISED ENDPOINT

# REVISIONS

- Update conceptual model;
- Compare/contrast response metrics with PA methods;
- Confounding stressors: Identify nutrient co-variates, explore and reduce co-variation as recommended in guidance (propensity scores, multiple regression, etc.);
- Use linear/non-linear simple regression with interpolation as recommended in guidance;
- Validate model outcomes with other data/sources;
- Report on accuracy/precision;
- Add mechanistic modeling line of evidence;
- Add additional scientific literature.

# Updated Conceptual Model

## Co-factors of Concern



Limited Data

# COMPARING METRICS

## MBSS Revised IBI - 2005

Piedmont
Number of Taxa *
Number of EPT *
Number of Ephemeroptera
% Intolerant Urban *
% Chironomidae
% Clingers

## PADEP 2009 – Freestone IBI

Candidate Metric
Total Taxa Richness
Ephemeroptera + Plecoptera + Trichoptera Taxa Richness (PTV 0 – 4 only)
Beck's Index – version 3
Shannon Diversity
Hilsenhoff Biotic Index
% Sensitive Individuals (PTV 0 – 3 only)

# CONFOUNDING CO-STRESSORS

- TP not correlated with many other stressors
- Propensity scores not needed – i.e. little appears to be confounding the nutrient effect per se.
- However, there are other stressors.

**Spearman Rank Order Correlations**

Variable	Nitrate	Total Nitrogen	Total Phosphorus	Dissolved Oxygen	pH	Conductivity	Sulfate	Turbidity	Instream	EPI Substrate	Embedded	Flow
Nitrate		0.988	0.061	0.248	-0.099	-0.081	-0.236	-0.027	0.015	0.061	-0.080	0.130
Total Nitrogen	0.988		0.099	0.239	-0.109	-0.070	-0.220	-0.011	0.002	0.043	-0.077	0.142
Total Phosphorus	0.061	0.099		-0.059	0.051	0.120	0.269	0.283	-0.145	-0.194	0.231	0.128
Dissolved Oxygen	0.248	0.239	-0.059		-0.029	-0.130	-0.181	-0.234	0.209	0.293	-0.193	0.232
pH	-0.099	-0.109	0.051	-0.029		0.548	0.518	-0.141	0.162	0.049	0.115	0.274
Conductivity	-0.081	-0.070	0.120	-0.130	0.548		0.730	-0.065	-0.205	-0.255	0.263	-0.112
Sulfate	-0.236	-0.220	0.269	-0.181	0.518	0.730		0.001	-0.182	-0.236	0.213	-0.034
Turbidity	-0.027	-0.011	0.283	-0.234	-0.141	-0.065	0.001		-0.101	-0.156	0.163	0.138
Instream	0.015	0.002	-0.145	0.209	0.162	-0.205	-0.182	-0.101		0.808	-0.423	0.512
EPI Substrate	0.061	0.043	-0.194	0.293	0.049	-0.255	-0.236	-0.156	0.808		-0.571	0.339
Embedded	-0.080	-0.077	0.231	-0.193	0.115	0.263	0.213	0.163	-0.423	-0.571		-0.109
Flow	0.130	0.142	0.128	0.232	0.274	-0.112	-0.034	0.138	0.512	0.339	-0.109	

Correlations in blue are more than or less than 0.5

Missing data is deleted pairwise



# CONFOUNDING CO-STRESSORS

- Correlations with biology
- Bug metrics correlate with other stressors:
  - conductivity/SO4/habitat

**Spearman Rank Order Correlations**

Variable	Nitrate	Total Nitrogen	Total Phosphorus	Dissolved Oxygen	pH	Conductivity	Sulfate	Turbidity	Instream	EPI Substrate	Embedded	Flow
Intolerant Urban %	0.137	0.104	-0.268	0.235	-0.393	-0.612	-0.522	-0.164	0.247	0.371	-0.345	-0.086
Chironomid %	-0.082	-0.058	0.147	-0.232	0.284	0.483	0.373	0.200	-0.231	-0.332	0.300	0.007
Clinger %	0.093	0.057	-0.183	0.242	-0.212	-0.448	-0.351	-0.218	0.327	0.412	-0.353	0.075
Total Taxa	0.242	0.225	0.022	0.058	-0.280	-0.389	-0.411	0.025	0.111	0.138	-0.077	0.051
EPT Taxa	0.270	0.239	-0.159	0.263	-0.286	-0.553	-0.492	-0.171	0.289	0.383	-0.328	0.089
Ephemeroptera Taxa	0.286	0.263	-0.107	0.257	-0.231	-0.569	-0.434	-0.061	0.240	0.302	-0.238	0.112

Correlations in red are significant at  $p < .05$

Missing data is deleted pairwise

# CONFOUNDING CO-STRESSORS

- Percent Intolerant Urban Taxa
  - TP adds an additional 7% to  $r^2$  (from 0.33 to 0.40)
- TP still matters

Regression Summary for the Dependent Variable of Intolerant Urban %						
	b*	Standard Error of b*	b	Standard Error of b	t(330)	p-value
Intercept			27.139	1.912	14.195	0.00000
Conductivity	-0.499	0.049	-14.854	1.459	-10.182	0.00000
Total Phosphorus	-0.139	0.043	-4.251	1.308	-3.249	0.00128
Turbidity	-0.157	0.042	-4.637	1.255	-3.694	0.00026
Flow	-0.198	0.047	-10.666	2.500	-4.266	0.00003
EPI Substrate	0.221	0.047	6.604	1.404	4.702	0.00000
pH	-0.101	0.049	-3.026	1.477	-2.049	0.04123
R= .69996489 R <sup>2</sup> = .48995084 Adjusted R <sup>2</sup> = .48067722						
F(6,330)=52.833 p<0.0000 Standard Error of estimate: 21.445						
N=337						

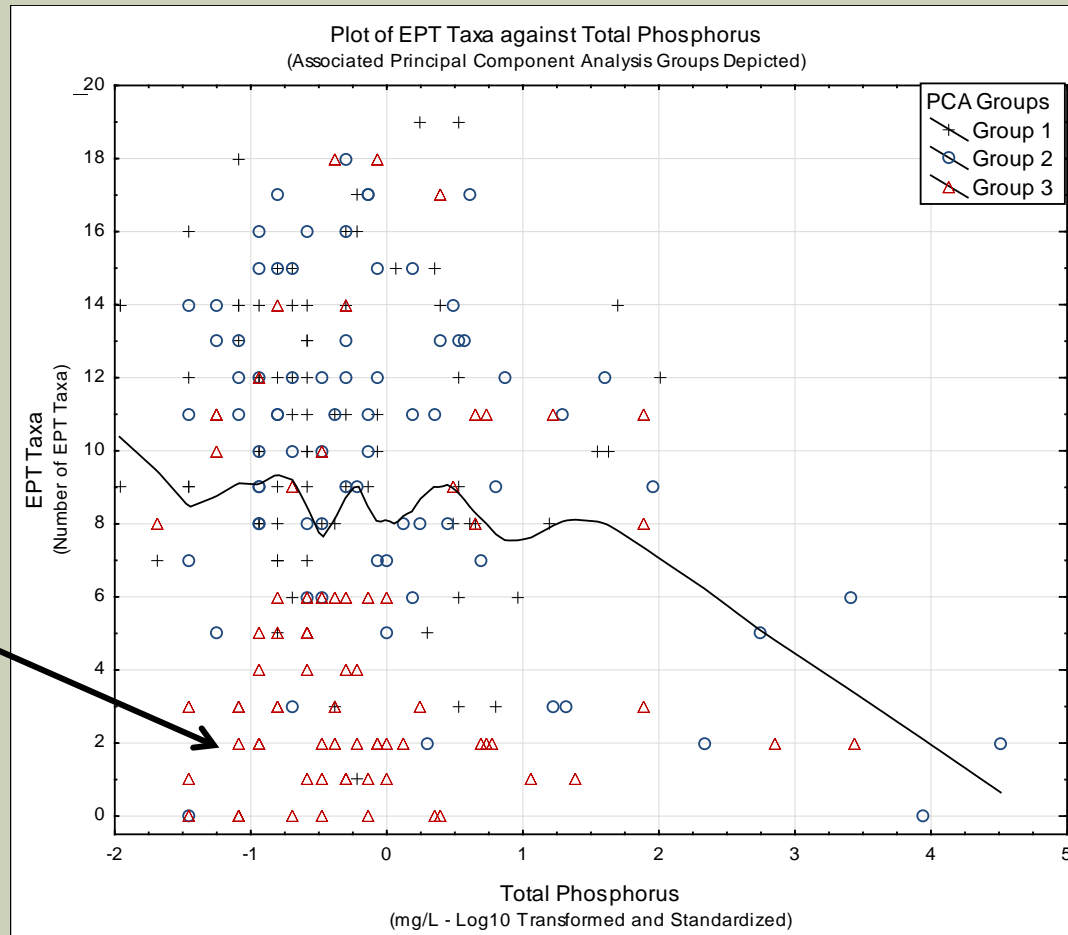
# CONFOUNDING CO-STRESSORS

- Urbanization (and associated other stressors) a likely confounding effect in models;
- Goal: reduce effect of urbanization on stressor-response relationship;
  - Focus on nutrient effect on invertebrates without confounding effect
  - Remember: Goal to recommend a TP endpoint to protect Piedmont streams

# CONFOUNDING CO-STRESSORS

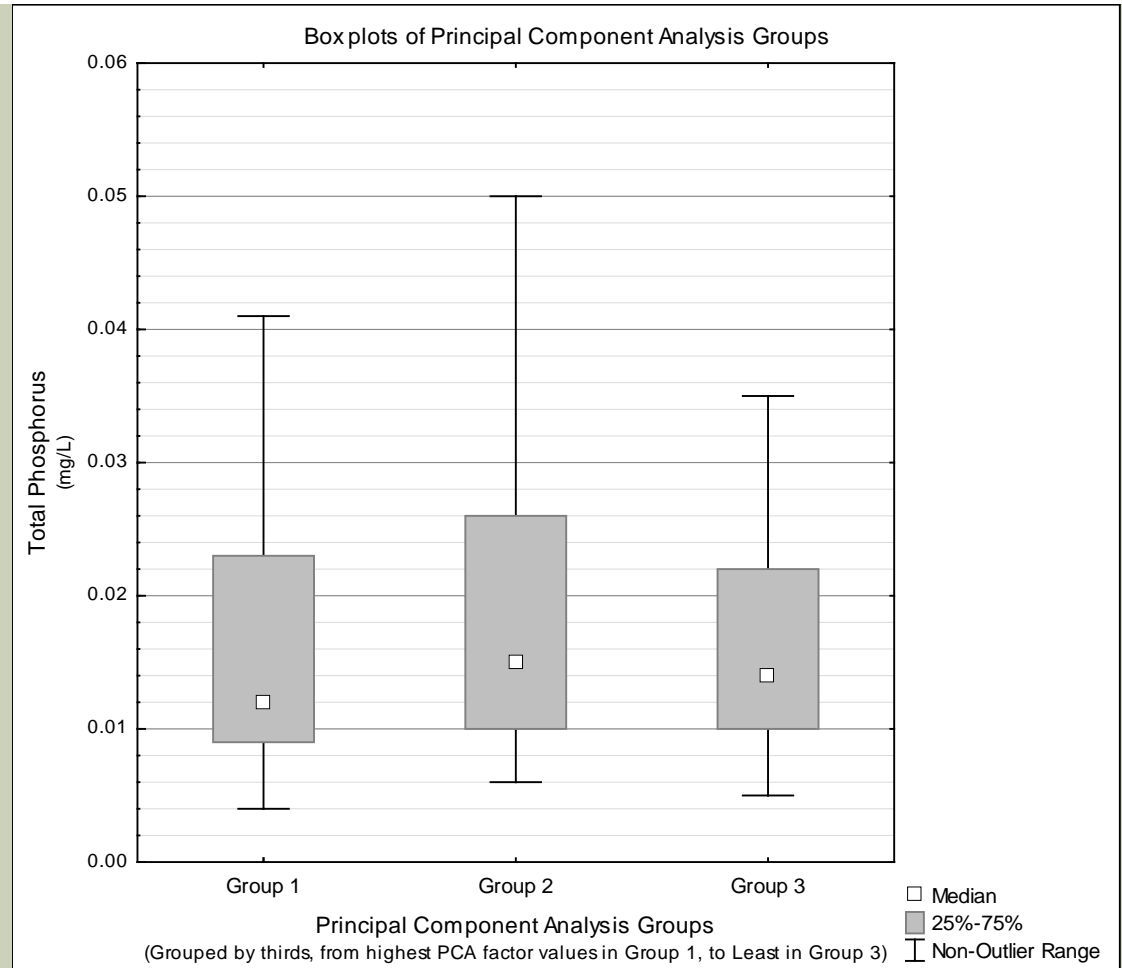
Used PCA to  
identify 3 bins:  
1 – least urban  
3 – most urban

A lot of the  
“noise” on left  
end is urban  
effects



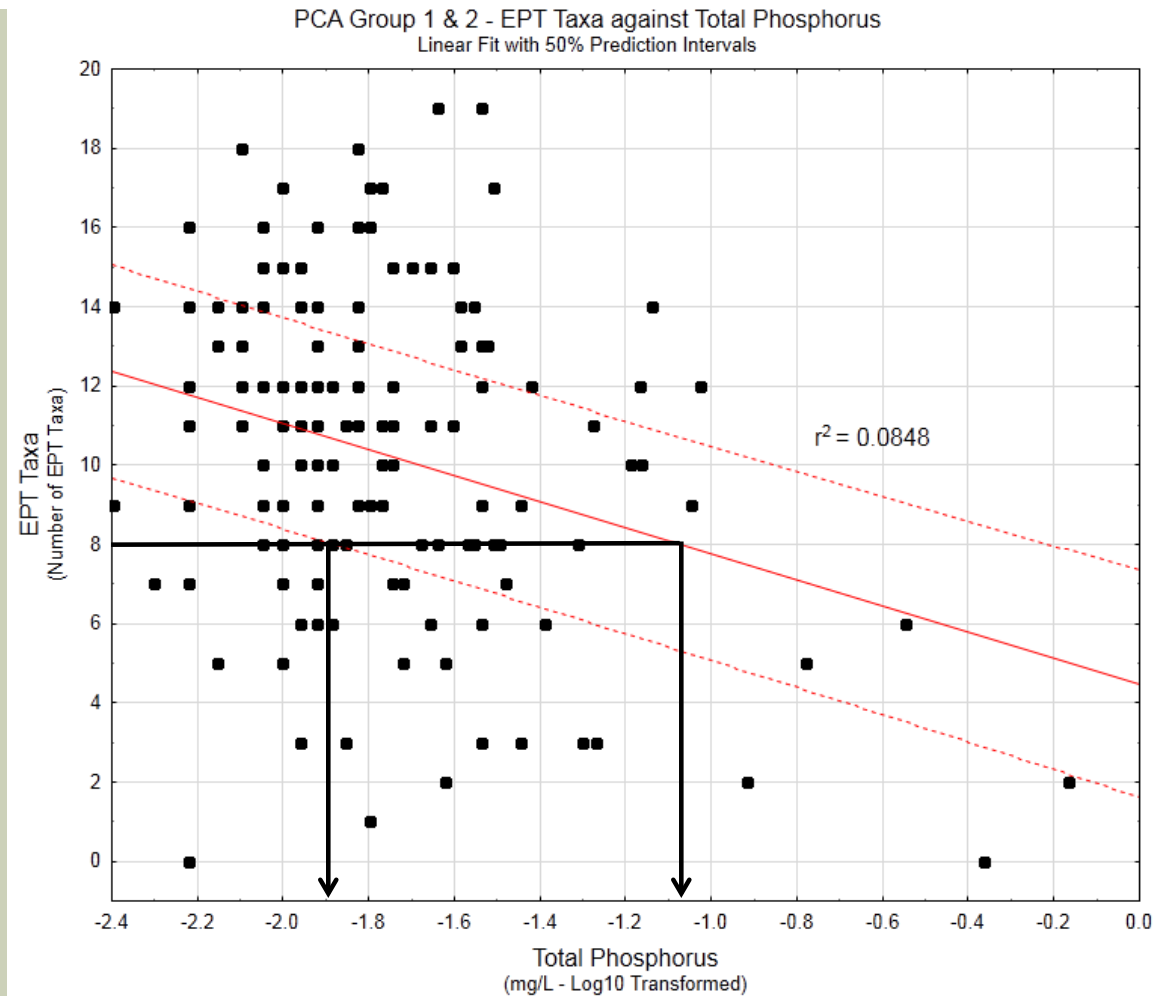
# CONFOUNDING CO-STRESSORS

- **TP pretty similar**
- **But urban stress very different**



# LINEAR REGRESSION AND INTERPOLATION

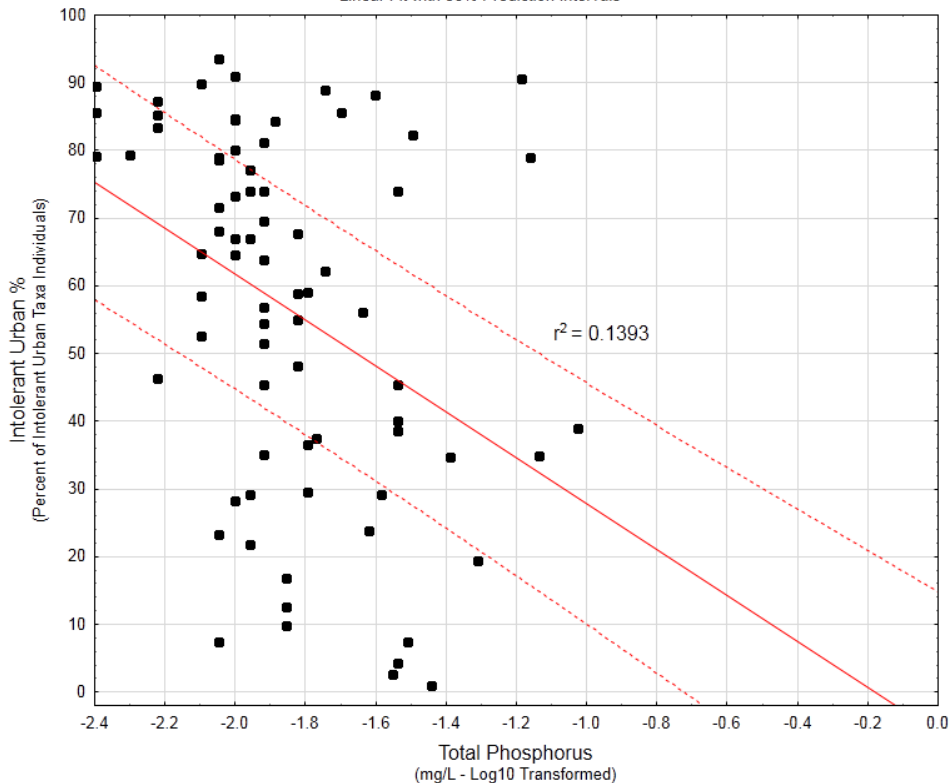
- Removed most urban group
- Improved models
- Ecological goals defined by Index (EPT = 8)
- Solve for TP concentration at goal (mean and lower quartile)



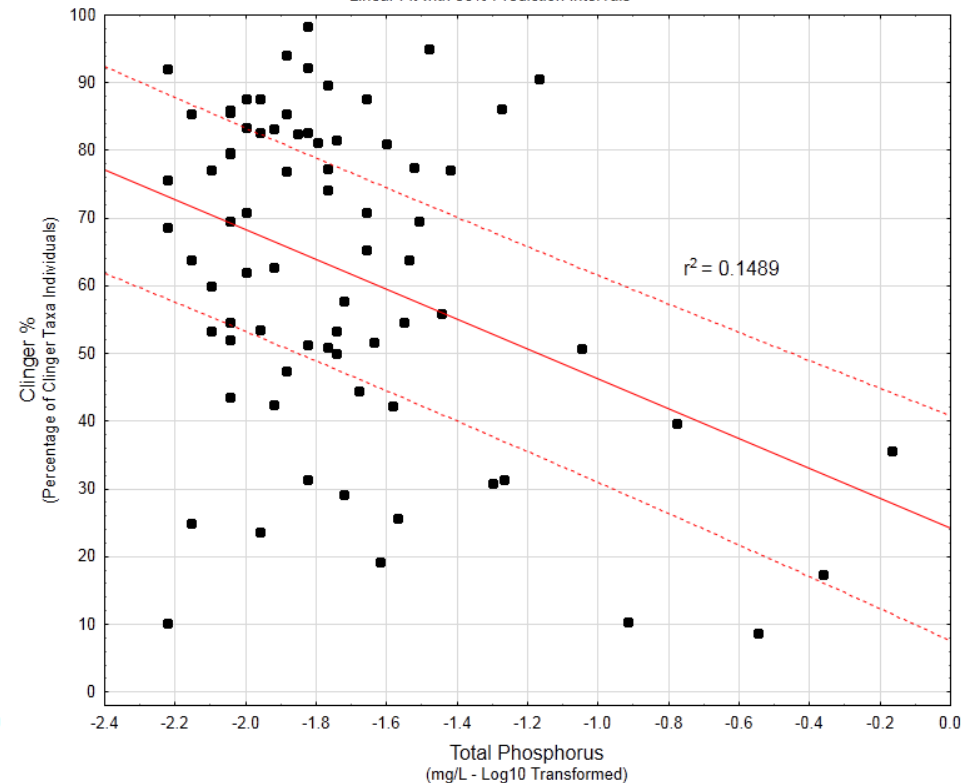
# LINEAR REGRESSION AND INTERPOLATION

- Same for other two response metrics used

PCA Group 1 - Plot of Intolerant Urban % against Total Phosphorus  
Linear Fit with 50% Prediction Intervals



PCA Group 2 - Plot of Clinger % against Total Phosphorus  
Linear Fit with 50% Prediction Intervals



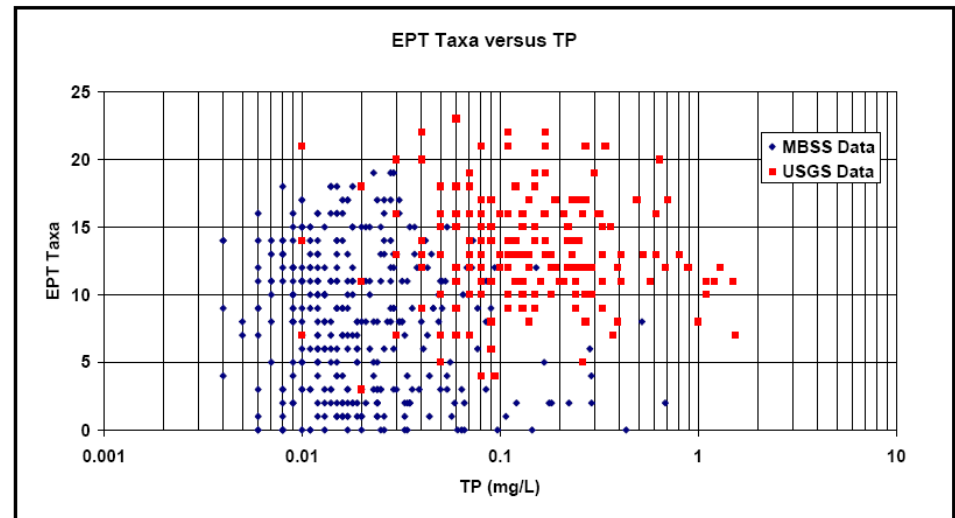
# LINEAR REGRESSION AND INTERPOLATION

		Interpolated TP (ug/L)	
Metric	Groups	lower quartile	average
EPT Taxa	Group 2	10	60
	Groups 1 and 2	10	85
Percent Intolerant Urban	Group 1	16	78
	Group 2	8	82
Percent Clingers	Group 2	8	52



# MODEL ACCURACY/PRECISION AND VALIDATION

- Statistical information always reported
- Validation – USGS data (Rief 1999, 2000, 2002)
- EPT Richness
- Red is USGS
- No relationships?
- Sampling issues....

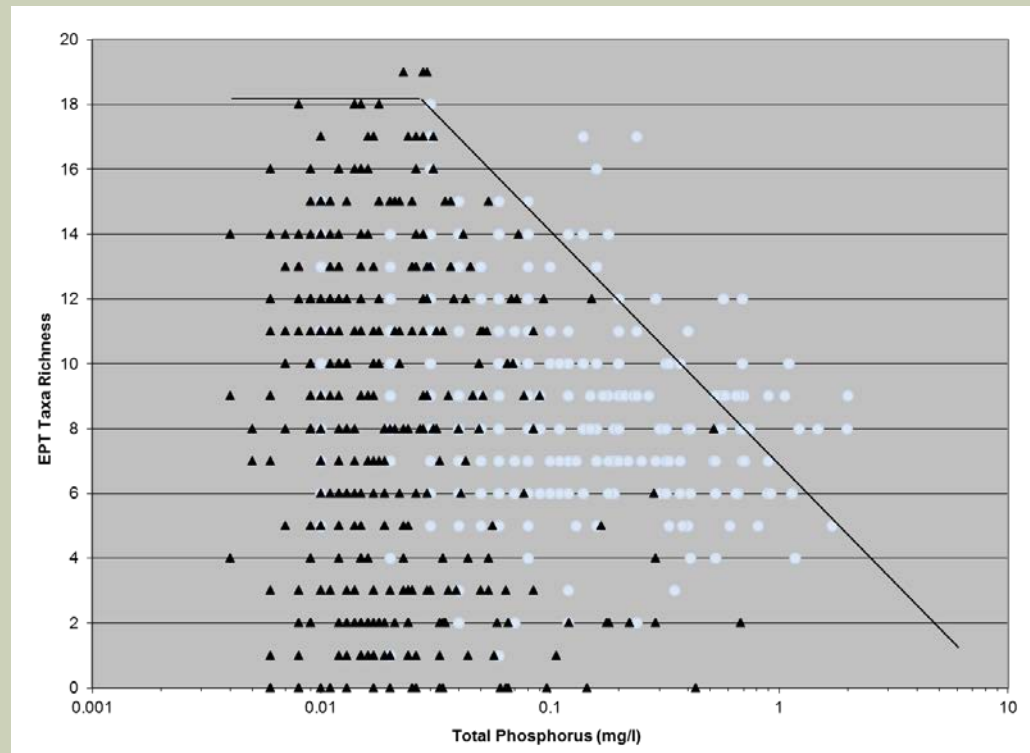


The original MBSS data used in the Paul and Zheng (2007) TP endpoint analysis was augmented with USGS data for the following 12 streams: Stony Run near Spring City; Ridley Creek at Goshenville, and at Dutton Mill near West Chester; East Branch Chester Creek at Westtown, and below Goose Creek near West Chester; Middle Branch White Clay Creek at Wickertown; East Branch Big Elk Creek at Elkview; West Branch Big Elk Creek near Oxford; Valley Creek near Atglen; West Branch Brandywine Creek, and East Branch Brandywine Creek at Wawaset; and, Brandywine Creek near Chadds Ford.

from: Hall (2008)

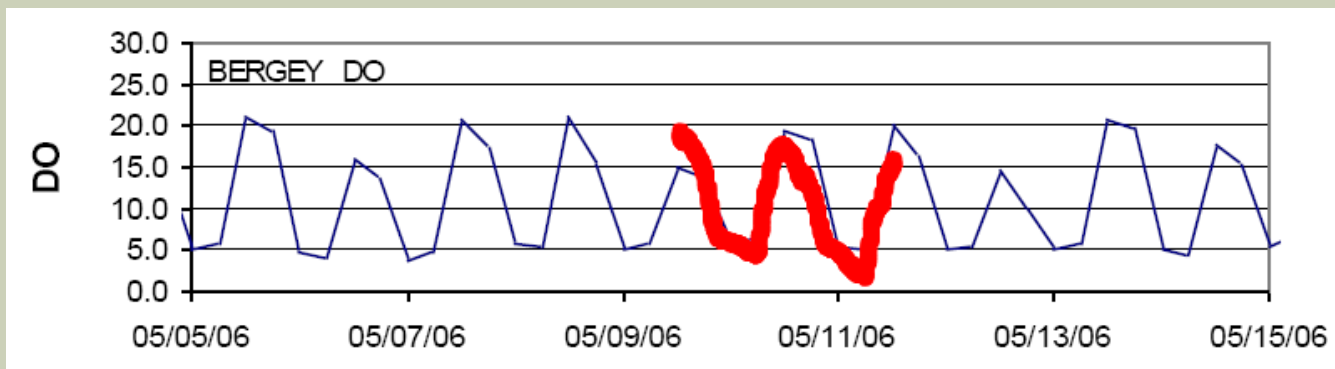
# MODEL ACCURACY/PRECISION AND VALIDATION

- Statistical information always reported
- Validation – USGS data (Rief 1999, 2000, 2002)
- EPT Richness – following resampling
- USGS data validates original relationship



# MECHANISTIC MODELING INDIAN CREEK

- GWLF and EFDC models of nutrients and responses
- Model DO response
- Calibrated model to DO and then explored reductions to meet 100 mg/m<sup>2</sup> chl a target
- TP = 20-33 µg/L



# REVISED TABLE

Revisited Endpoint

Approach		TP Endpoint (µg/L)
Reference Approach	Reference Site 75 <sup>th</sup> Percentile	2-37
	All Sites 25 <sup>th</sup> Percentile	16-17
	Modeled Reference Expectation	17
		2-37
Stressor-Response		8-85
	Conditional Probability – EPT taxa	38
	Conditional Probability - % Clingers	39
	Conditional Probability - % Urban Intolerant	64
	Conditional Probability - Diatoms TSI	36
	Simple linear regression interpolation – EPT taxa	10-85
	Simple linear regression interpolation – Percent intolerant urban individuals	8-82
	Simple linear regression interpolation – Percent Clinger individuals	8-52
Other Literature		13-100
	USEPA Recommended Regional Criteria	37
	USEPA Regional Criteria Approach – Local Data	40-51
	Algal Growth Saturation	25-50
	Nationwide Meta-Study TP-Chlorophyll	21-60
	USGS Regional Reference Study	20
	USGS National Nutrient Criteria Study	13-20
	New England Nutrient Criteria Study	40
	Virginia Nutrient Criteria Study	50
	New Jersey TDI	25-50
	Delaware Criteria	50-100
Mechanistic Model	National Reference Criteria Study	60
	Indian Creek	20-33

# TP TARGET – LINES OF EVIDENCE

- Target: remains unchanged at 40 µg/L TP
- Stressor-responses models strengthened
  - Follow SAB reviewed S-R guidance
- Higher than distribution based approach
- Consistent with upper end modeled reference
- Consistent with mechanistic models
- Consistent with regional literature
- Multiple lines of evidence still supports original endpoint

# THE END